### Covariances

D. Brown, BNL



a passion for discovery



## I am trying to capture your view of how to arrange nuclear data

- I will present the consensus view of required arrangement of nuclear data,
  - presented at SG38 Meeting in Tokai, Japan, Dec. 2013
  - revised and presented at SG38 Meeting in Paris, France, Apr. 2014
  - revised again for this meeting
- Element & attribute names are illustrative. They can be changed.
- From these discussions, I think we are OK with:
  - approach to sensitivity matrix
  - linking concepts to unify the ENDF covariance data

Requirements for a top level hierarchy for a next generation nuclear data format

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B. Beck,<sup>5</sup> R. Vogt,<sup>6</sup> M. White,<sup>7</sup> P. Talou,<sup>7</sup> and A.H. Kahler<sup>7</sup>

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<sup>2</sup>NRG Petten, Netherlands

<sup>3</sup>AECL, Chalk River Laboratories, Canada

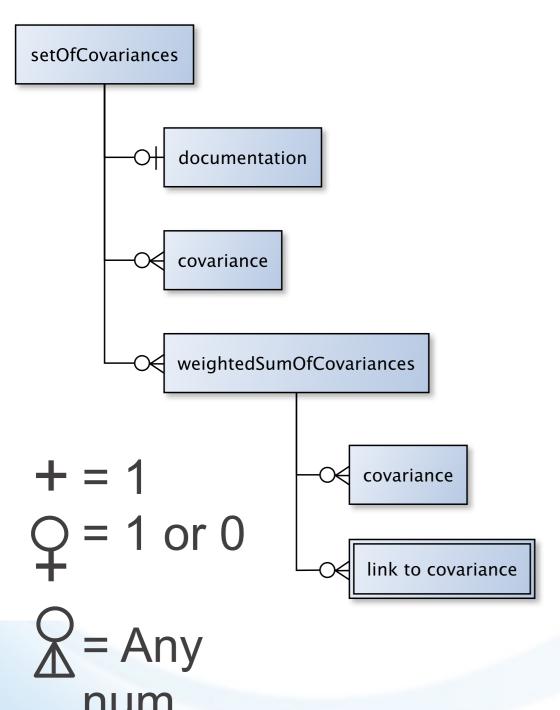
<sup>4</sup>National Nuclear Laboratory, United Kingdom

<sup>5</sup>Lawrence Livermore National Laboratory, USA

<sup>6</sup>Lawrence Livermore National Laboratory, USA



#### <setOfCovariances>

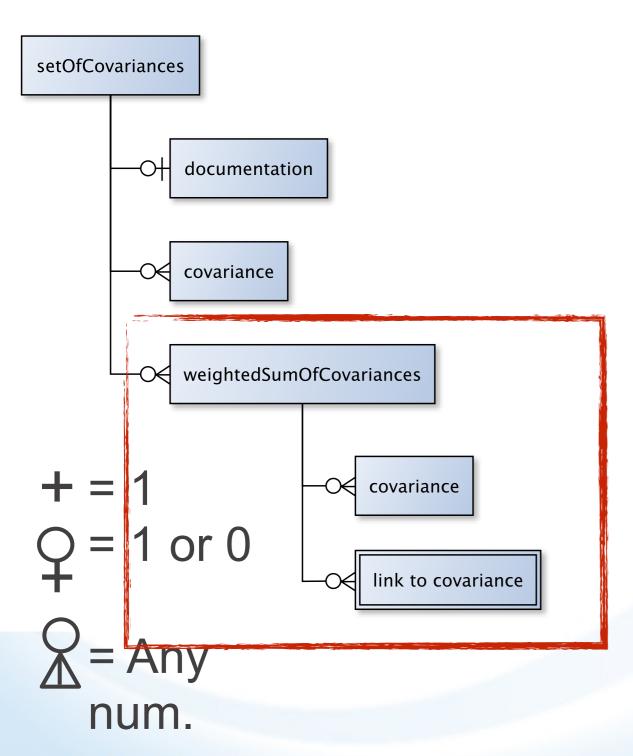


- Covariances can be big
- They can encode correlations across material, reaction, observable

#### However

- They are just matrices
- You just have to know how to pack them
- <setOfCovariances> is easy way to group them
- Must allow to store separately

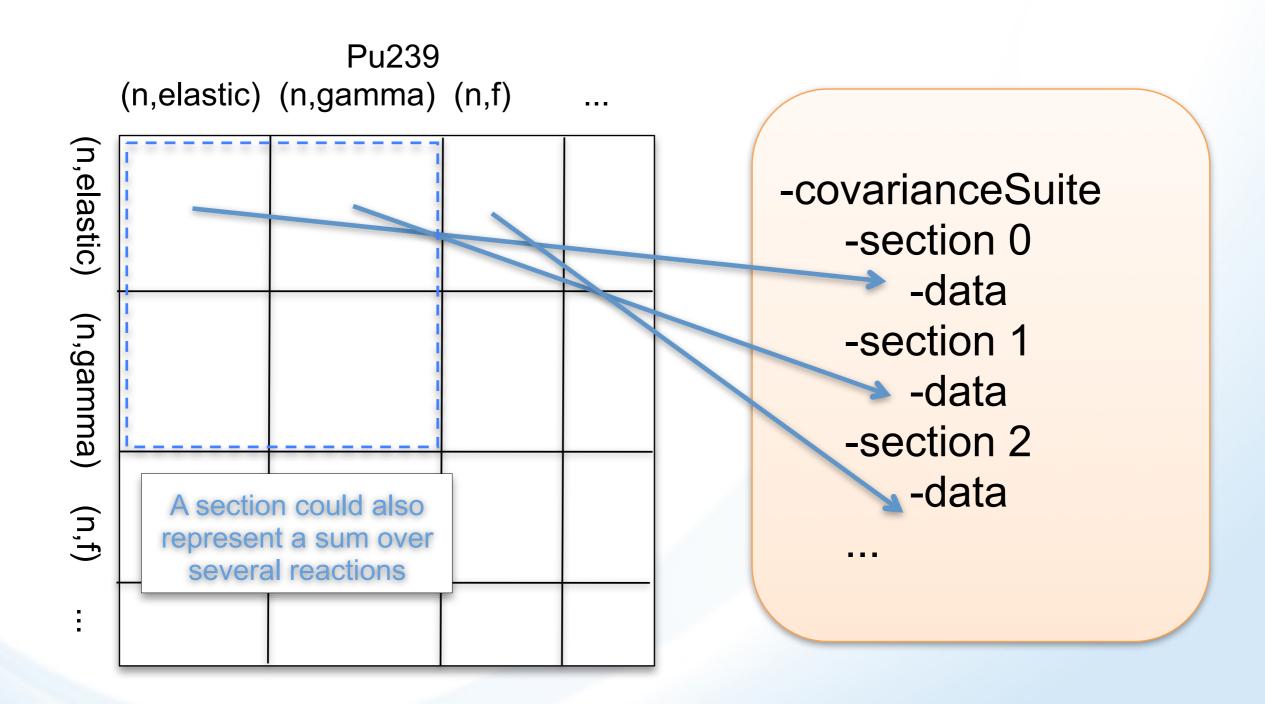
#### <setOfCovariances>



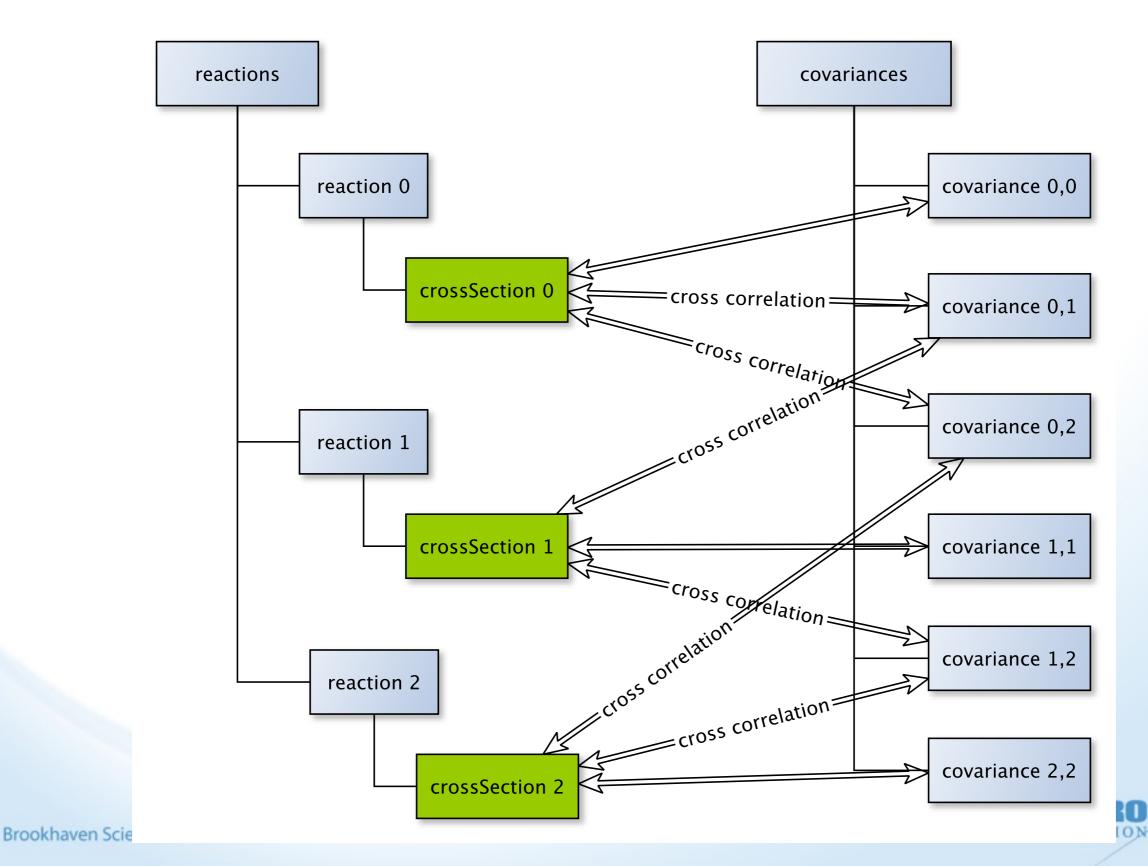
- weightedSumOfCovariance is just list of covariance (or link to covariance) with a weight
- This is just ENDF LC-type covariances (i.e. cov. for (n,tot) is sum of cov. for (n,el) and (n,g))
- Can be "abused" to break out long-, medium- and short- range correlations
- Relies on <covariance>



### View covariances using block matrix construction



### Blocks of a covariance have to be associated with the data



### Should we put uncertainties with the data itself?

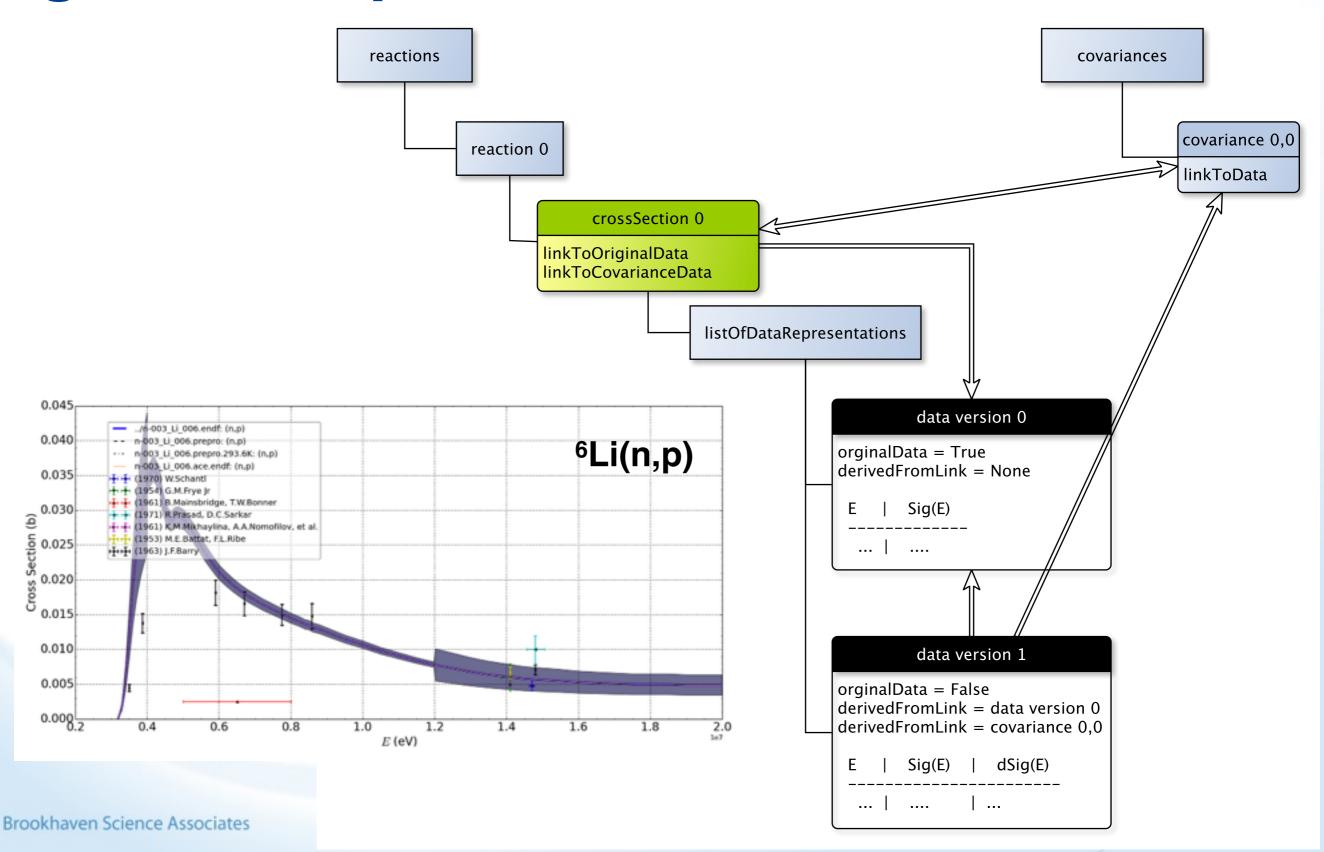
- Very user friendly
- Simpler plotting

but...

- Not the whole story: what about covariance?
- How do we keep uncertainty & covariance data synchronized?

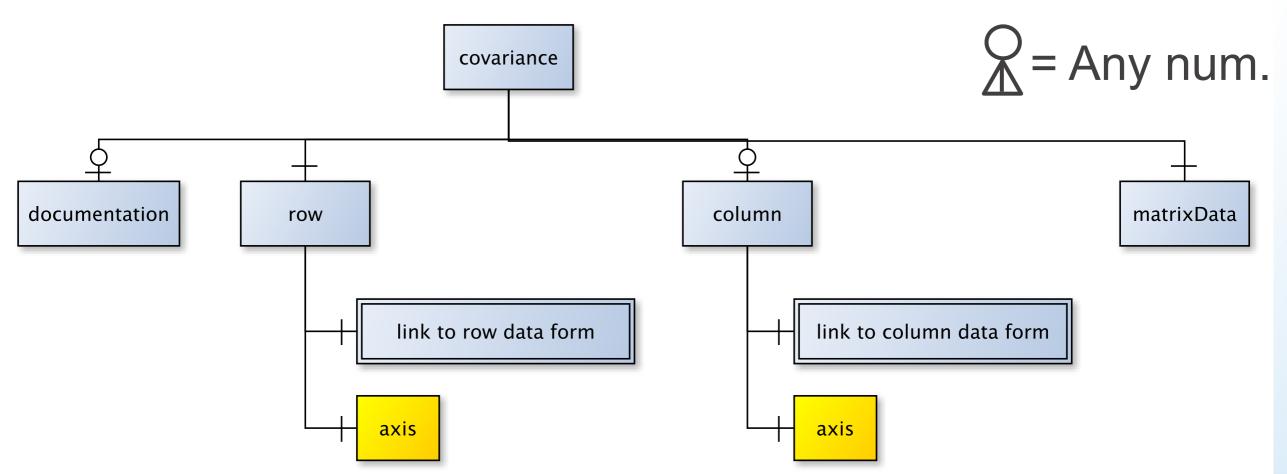


## Covariance data can be used to generate "plottable" cross sections



#### covariance

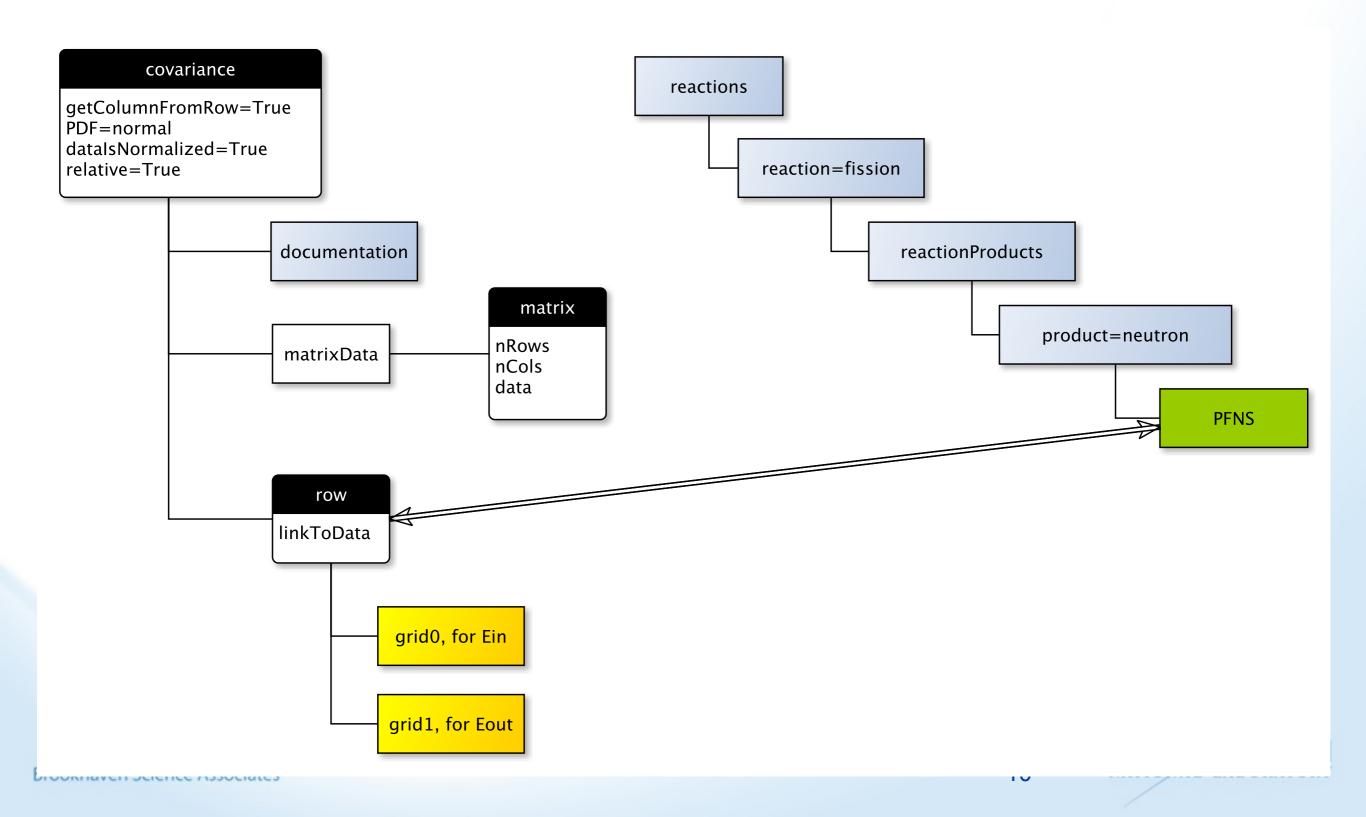
$$+ = 1$$
  
 $Q = 1 \text{ or } 0$ 



- Need <row> to describe the data <> < covariance > mapping
- If cross-correlation, need <column> too
- The matrix itself is in <matrixData>
- Covariance needs optional attribute to denote the PDF
- <axis> now called <grid>



## PFNS "example", detailing links to data & the grids in the row element



## How to map the row with the matrix itself: the magic of <grid>

<grid> is list of "group boundaries" for covariance in ENDF, this defines the bins:

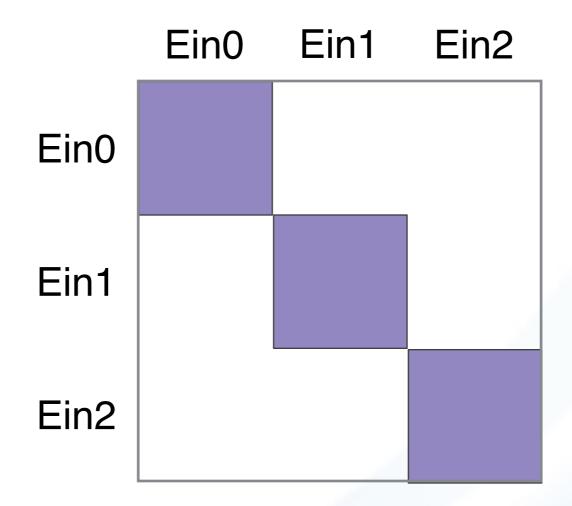
```
<grid index="0" label="rows" unit="eV" length="3"> 1e-5 1e5 2e+7</prid>
```

- For multiple grids in a row (column),
  - loop though highest index grid bins first (in PFNS, this is Eout),
  - then the second last
  - •
  - finally the first (usually Ein)
- nRows better equal nBins0 \* nBins1 \* nBins2 \* ...
- <grid> can have a "style" attribute with value "parameters". We'll use this later…



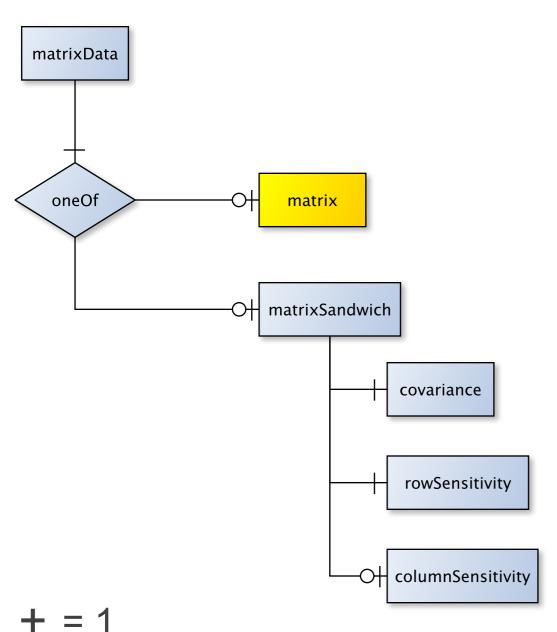
### An aside on the PFNS example

 ENDF PFNS covariances do not allow cross correlations between incident energies.



Do we need "regions" here? Or is there an acceptable block matrix construction markup?

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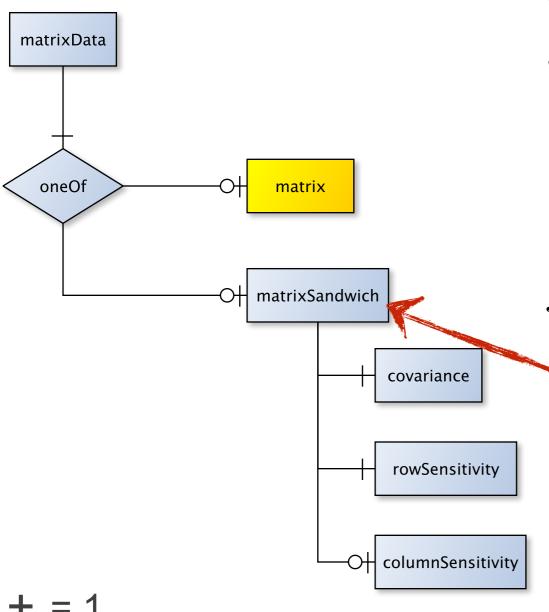
We understand <matrix>, but what is a <matrixSandwich>? It is just sandwich rule for propagating covariance:

$$f_{i}(\vec{x}) \approx f_{i}(\langle \vec{x} \rangle) + \sum_{j} \frac{\partial f_{i}(\langle \vec{x} \rangle)}{\partial x_{j}} (x_{j} - \langle x_{j} \rangle)$$
$$cov f_{ij} = \sum_{i'j'} sens_{ii'} cov x_{i'j'} sens_{j'j}$$

 For cross-correlations, need two sensitivity matrices

Q = 1 or 0

 $\Delta$  = Any num.



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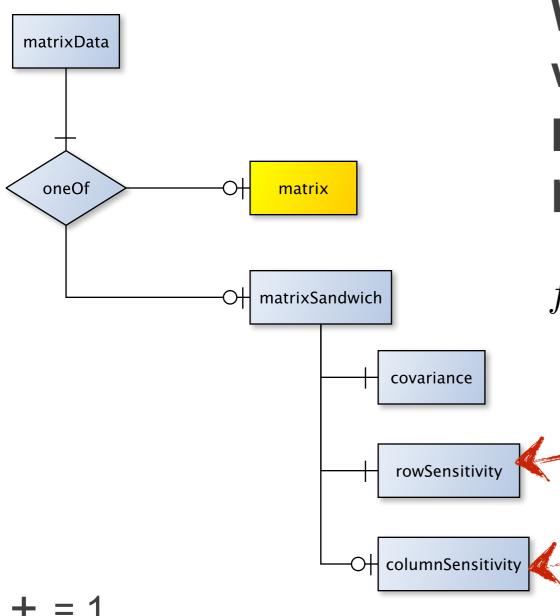
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$$\cot f_{ij} = \sum_{i'j'} \operatorname{sens}_{ii'} \cot x_{i'j'} \operatorname{sens}_{j'j}$$

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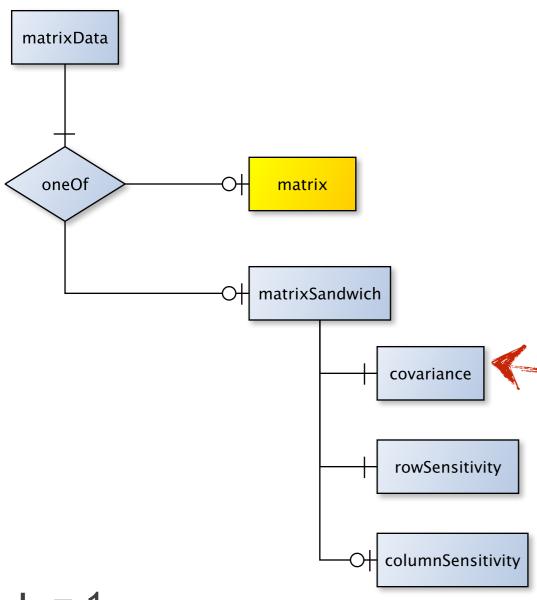
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= 1 or 0

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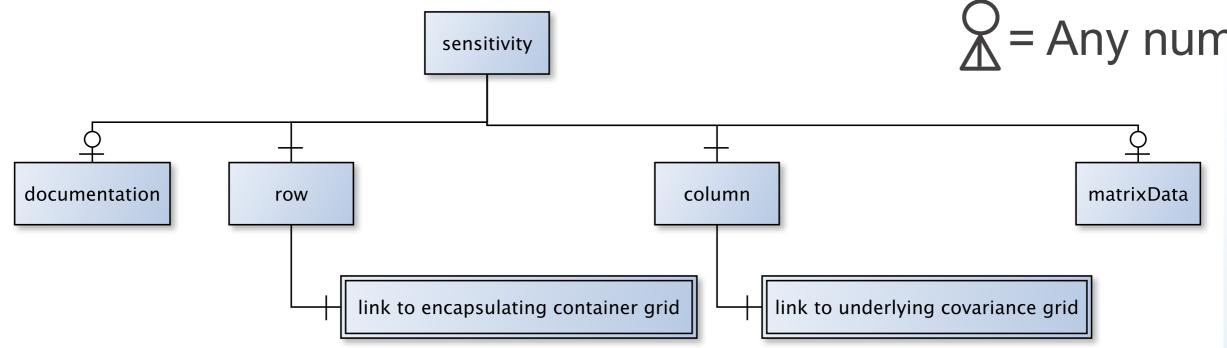
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$$cov f_{ij} = \sum_{i',i'} sens_{ii} (cov x_{i'}) sens_{j'j}$$

 For cross-correlations, need two sensitivity matrices

### sensitivity

```
+ = 1
Q = 1 \text{ or } 0
R = Any num
```

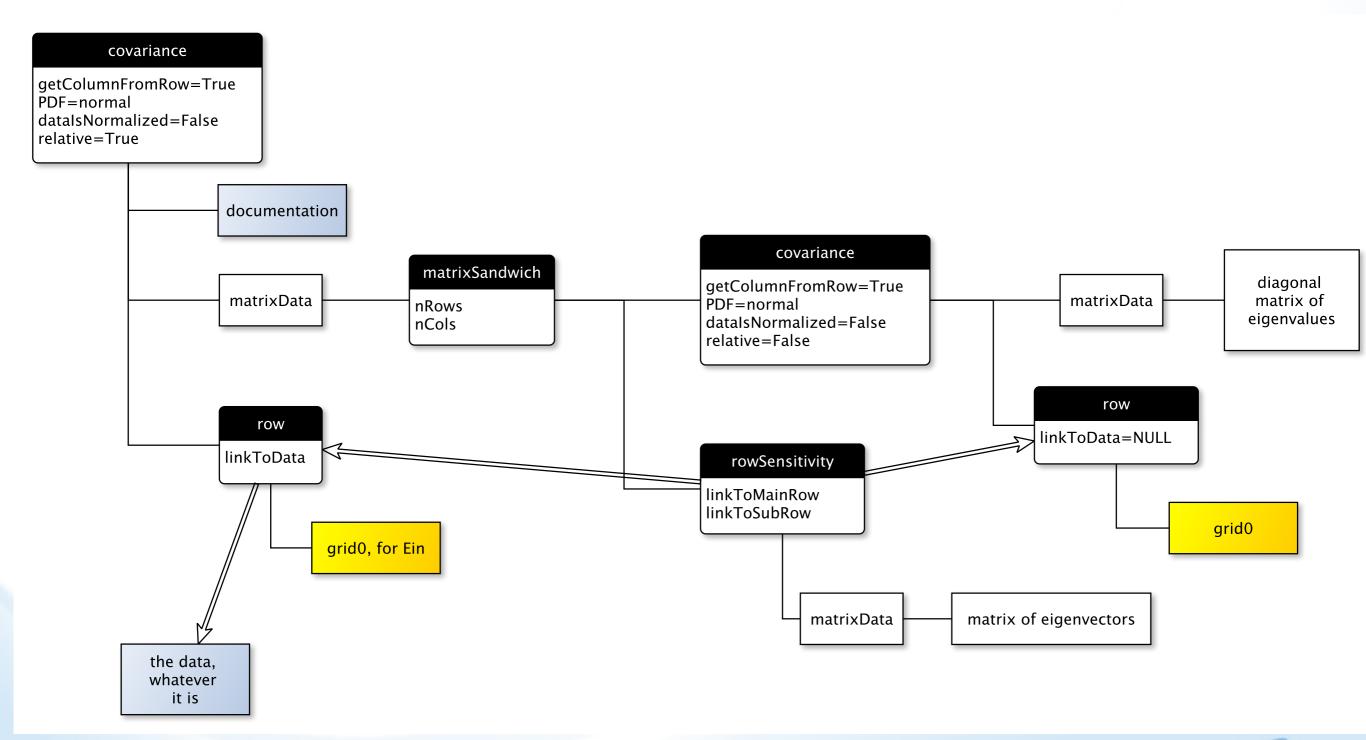


- Sensitivity can be given by equation (e.g. RRR)
- Or can be a matrix
- <row> links to data grid
- <column> links to parameter covariance grid
- Both row and column must be specified
- For RRR's MF=32 data, matrixData optional, since covariance is parameterized

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# Using sensitivity matrix to encode eigenvalue decomposition



## RRR parameter covariances require sensitivity matrix

